

A proposed approach for the assimilation of cloudy infrared radiances: impact study based on AIRS simulations

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AIRS assimilation at EC

- Current status: 87 channels to be assimilated operationally in fall 2007. RTTOV-8 RTM. Thinning : 250 km. About 90,000 radiances per 6h. Dynamic bias correction. Model top 10 hPa, 58 levels.
- ~125 channels planned for fall 2008 with model top at 0.1 hPa, 80 levels.
- Active research on cloudy radiance assimilation

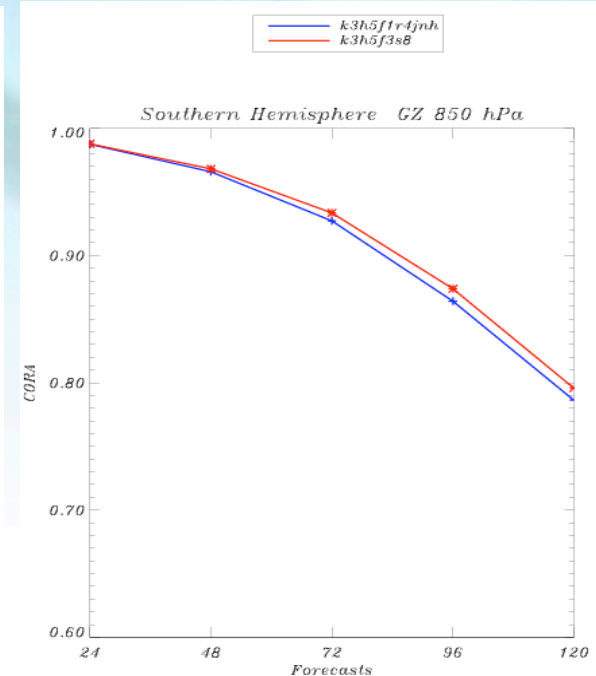
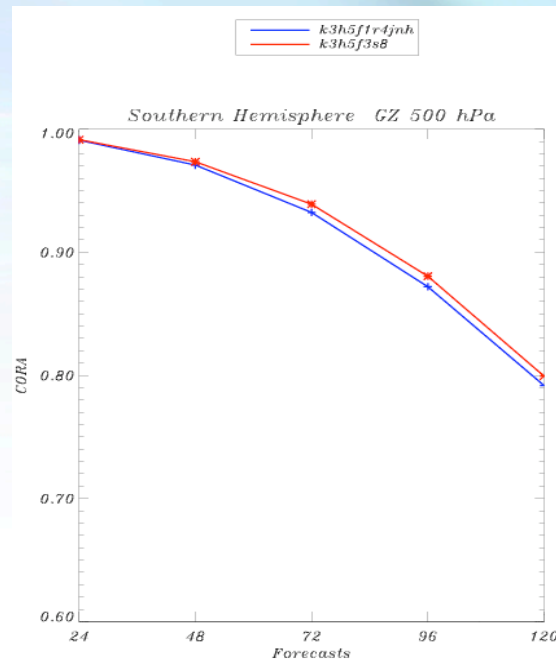
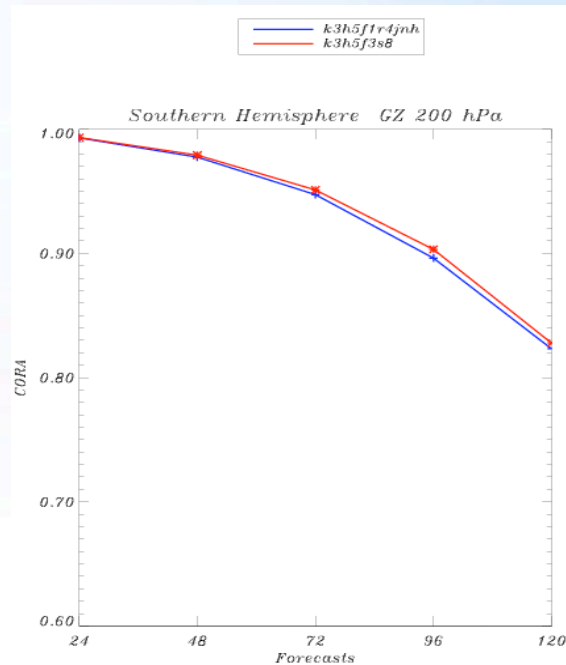


GZ anomaly correlations AIRS-NOAIRS

200 hPa

500 hPa

850 hPa



SH, 35 days, winter 2005-2006, 3D-FGAT. AMSU-A from AQUA assimilated
In both cycles.

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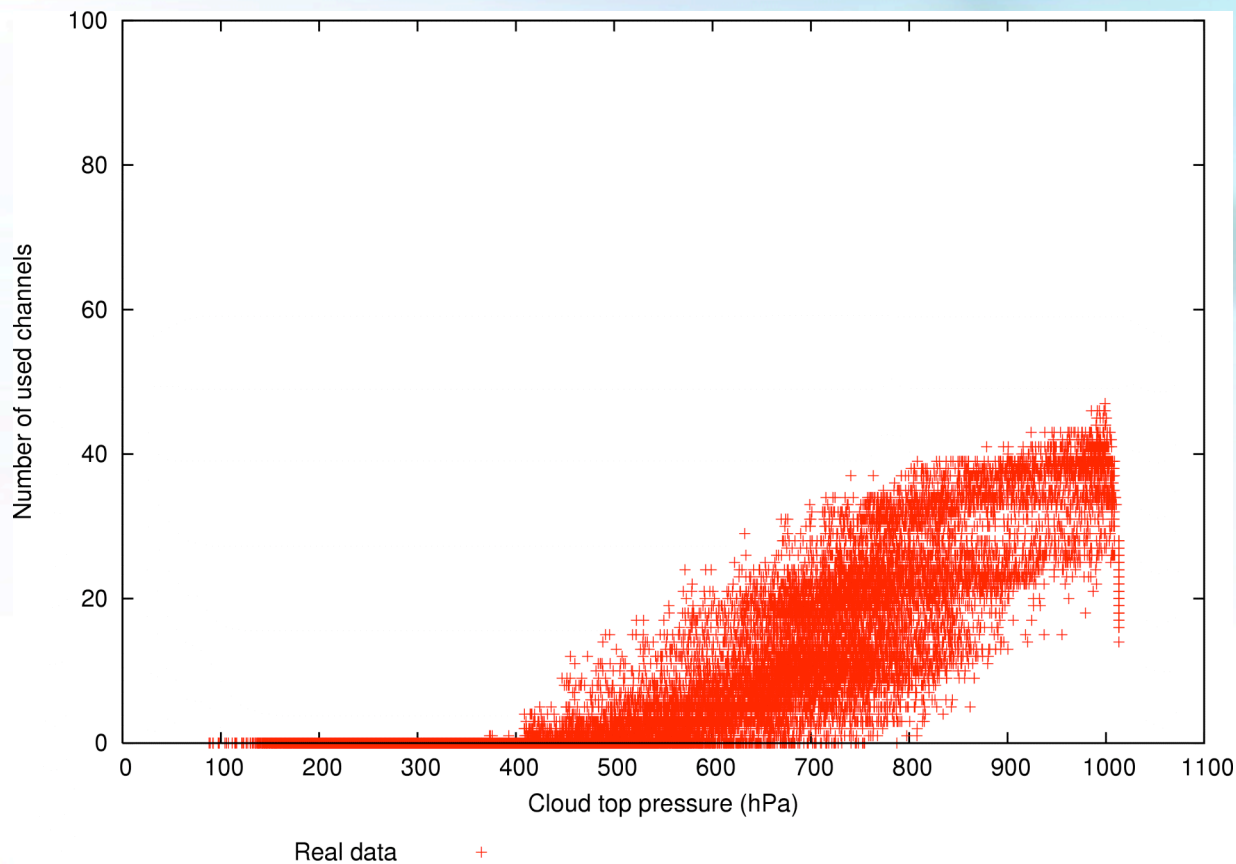


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Cloud affected radiances: a severe limitation



Clear skies: all 100 channels used at night

Less in daytime

Low clouds: max of 45 channels used

Cloud top above 400 hPa: no AIRS channels are assimilated in our system due to broad response functions

Example based on real data with 100 channels considered

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Simplified approach to cloudy radiance modeling and assimilation

- Approach chosen: cloudy radiance computed assuming a single-layer cloud defined by an effective height P_c and emissivity $N\varepsilon(\nu)$:

$$I_{cld}(\nu) = N\varepsilon(\nu) I_{\text{sky}}(\nu) + (1 - N\varepsilon(\nu)) I_{\text{surf}}(\nu)$$

- Not oversimplified however: cloud emissivity to depend on wavelength and phase. Mixed phase considered. RTM and TL/AD modified accordingly.

Cloud emissivity model

$$N\alpha(\nu) = 1 - \exp[-k_{cld}(i)\delta]$$

δ : effective cloud water path (= $\sec\theta \Delta P \text{ g}^{-1} \text{ CWC}$)

k_{cld} cloud effective absorption coefficient accounting approximately for scattering following Chou et al. 1999 :

$$k_{cld}(i) = k_{ext}(i) \left[(1 - \omega(i)) + b(i)\omega(i) \right]$$

With ω the single scattering albedo, k_{ext} the extinction coefficient and b the backscattered fraction :

$$b = \frac{1}{2} \int_0^1 d\mu \int_{-1}^0 \overline{P}(\mu, \mu') d\mu'.$$

Cloud emissivity model: mixed phase

- Liquid cloud optical properties from Lindner and Li (2000) parameterization as a **function of the effective radius r_e** (for k_{ext} , ω , g).
- Ice cloud optical properties from Baran et al. (2004, 2002 and 2005 private communication) for hexagonal column ice crystals as a **function of the effective diameter D_e** .

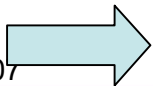
Optical properties are combined given the liquid fraction f_w from Rockel et al. (1991)

$$f_w = \begin{cases} 0.0059 + 0.9941 \exp[-0.003102(T_c - 273.16)^2] & T_c < 273.16 \\ 1.0 & T_c > 273.16 \end{cases}$$

$$k_{ext} = f_w k_{ext}^w + (1 - f_w) k_{ext}^i \quad \quad \dot{u} = \frac{f_w k_{ext}^w \dot{u}^w + (1 - f_w) k_{ext}^i \dot{u}^i}{f_w k_{ext}^w + (1 - f_w) k_{ext}^i}$$

$$b = F(g) \approx \frac{1 - g}{2} \quad \text{with} \quad g = \frac{f_w k_{ext}^w \dot{u}^w g^w + (1 - f_w) k_{ext}^i \dot{u}^i g^i}{f_w k_{ext}^w \dot{u}^w + (1 - f_w) k_{ext}^i \dot{u}^i}$$

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All parameterizations easily differentiable for AD/TL/K RTM



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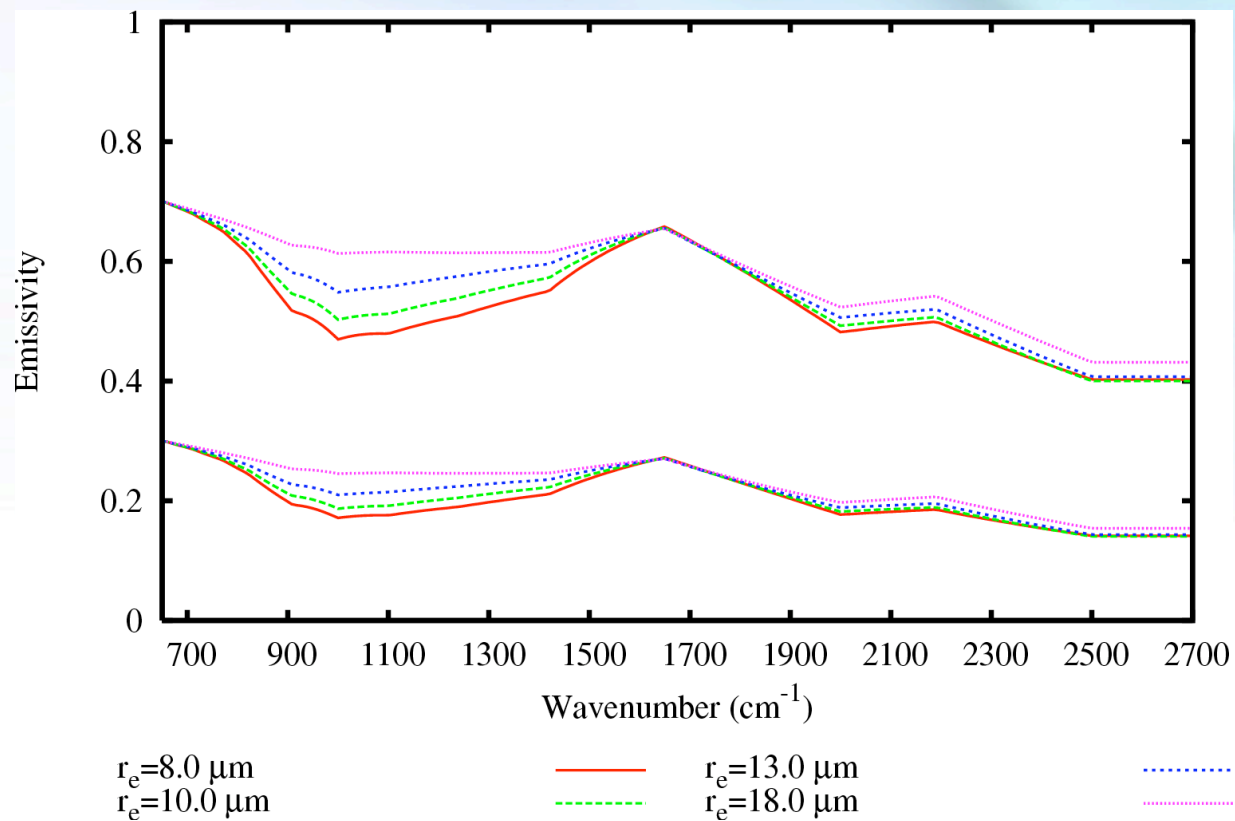
Cloud emissivity model: summary

- To summarize a full cloudy radiance spectrum can be simulated using only 4 cloud parameters, independent of wavelength:
 - The cloud top pressure P_c (gives also the cloud temperature T_c)
 - The effective cloud water path δ
 - The cloud effective radius r_e (liquid phase)
 - The cloud effective diameter D_e (ice phase)
- Dependence of emissivity and waveleght, phase via modeling



Examples of cloud emissivity spectra

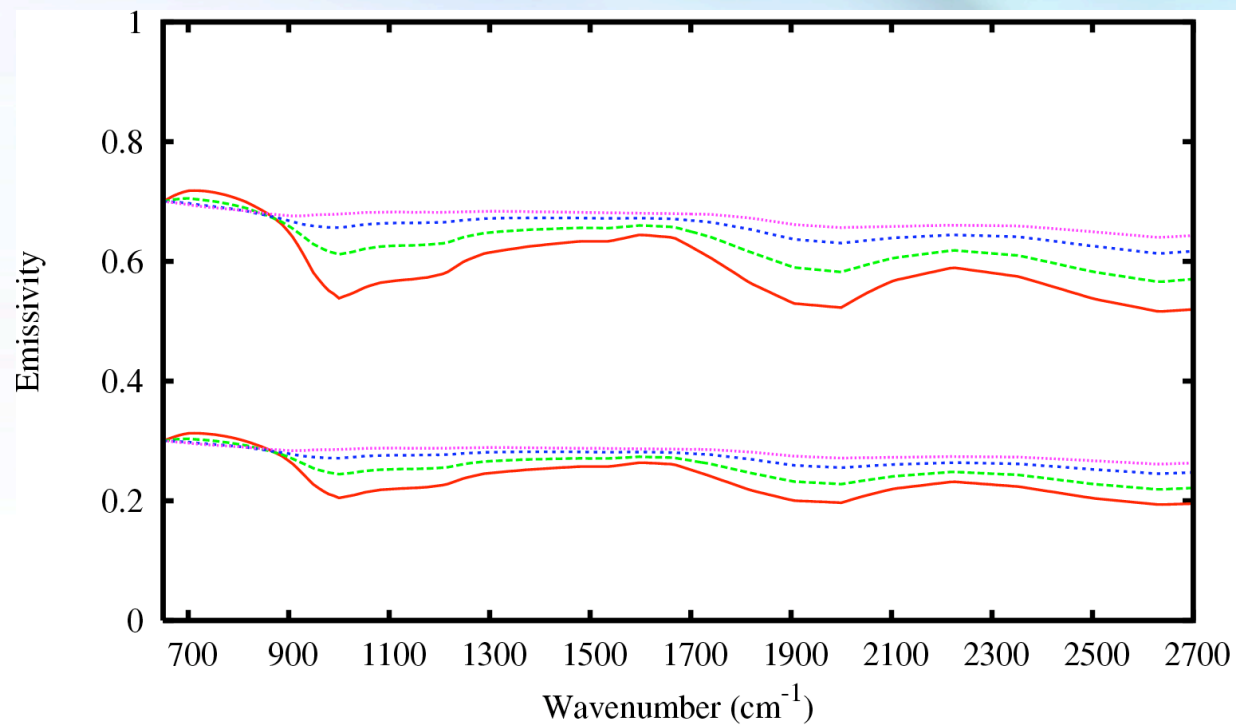
Liquid Water cloud: 15 μ emissivity set to 0.7 or 0.3 (δ fixed)



Note: AIRS gap
1614-2181 cm^{-1}

Examples of cloud emissivity spectra

Ice Water cloud 15 μ emissivity set to 0.7 or 0.3 (δ fixed)

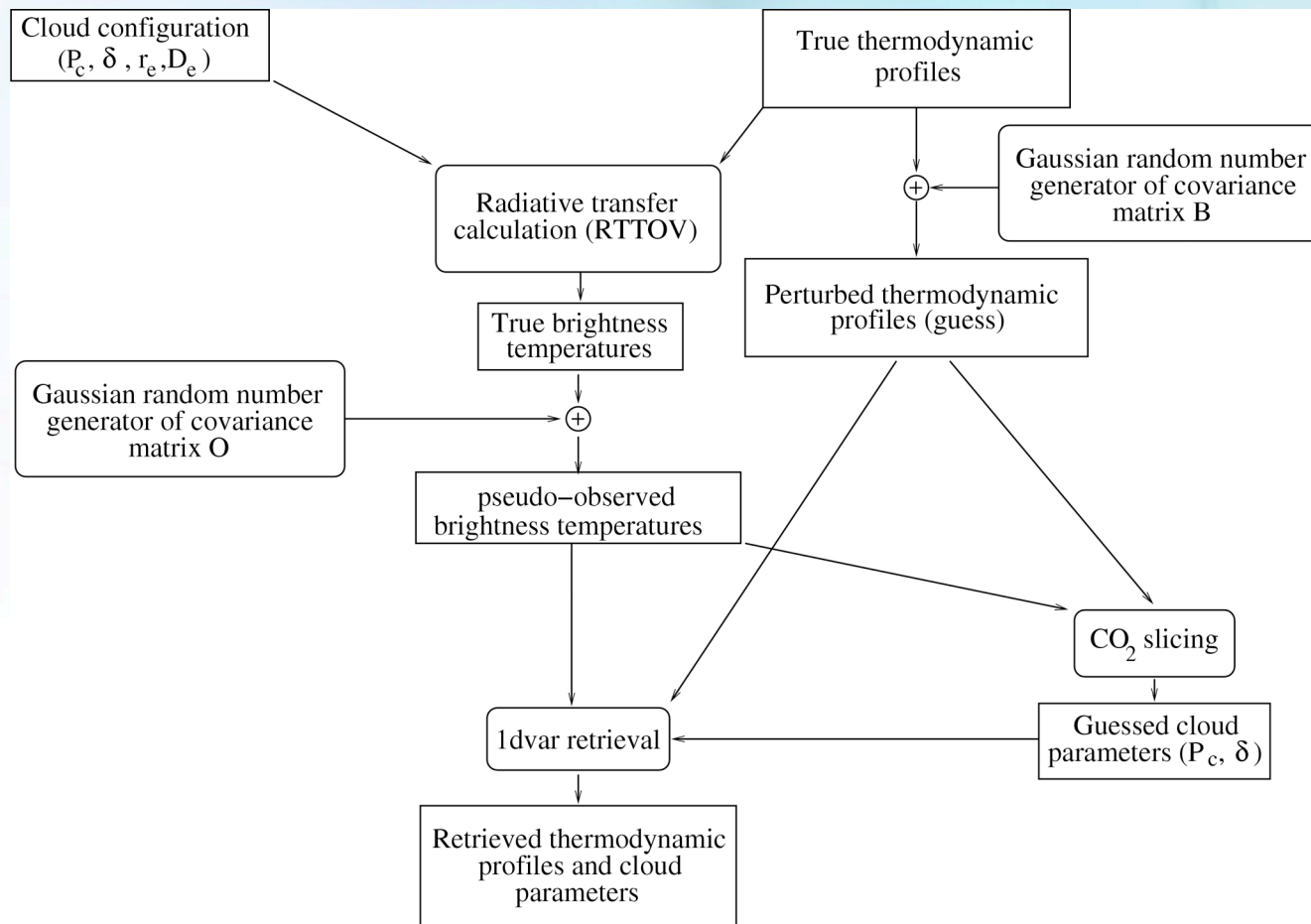


$D_e=25.0 \mu\text{m}$
 $D_e=50.0 \mu\text{m}$

$D_e=75.0 \mu\text{m}$
 $D_e=100.0 \mu\text{m}$

Note: AIRS gap
1614-2181 cm^{-1}

Principle of the Monte-Carlo experiments



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Each cloud configuration perturbed 1000 times

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Monte-Carlo experiments: definitions

- The 1D-var experiments were performed with various background constraints or conditions:
 - **CLR** : using only channels insensitive to cloud
 - **FREE**: using all channels with free cloud parameters
 - **CTRLD**: using all channels with constrained cloud parameters
 - **FXD**: using all channels with fixed cloud parameters
 - **BT3SIG**: one of the above using only channels for which the background departure (O-P) is lower than 3 times the standard deviation of $\langle O-P \rangle$ for the 1000 cases
- Nine cloud configurations: $P_c = 850, 500, 500$ hPa and 15 micron emissivity = 0.3, 0.7, 1.0.

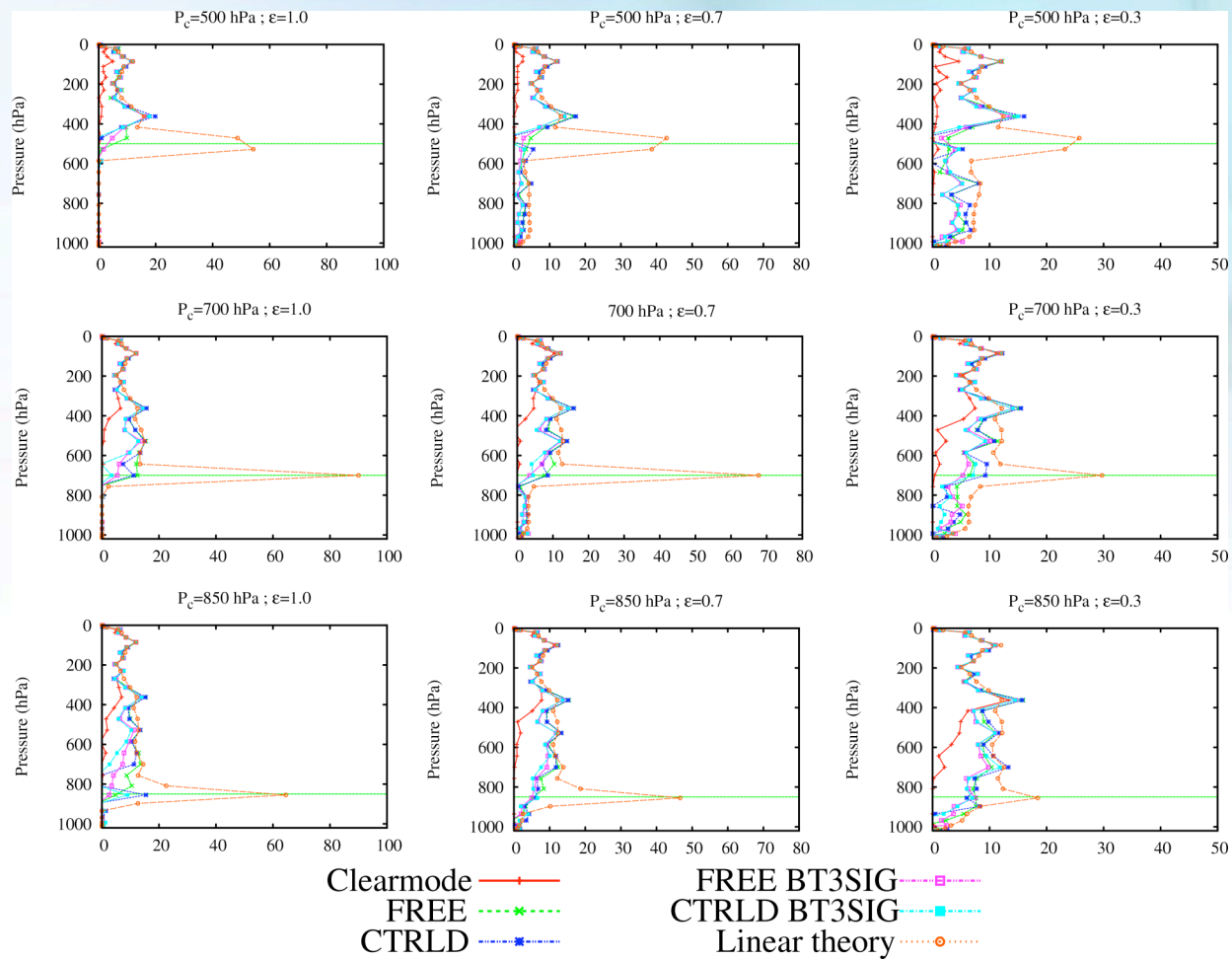


Monte-Carlo experiments: outputs

- Statistics calculated for 1000 realizations for each of the 9 cloud configurations :
 - Bias : $\mathbf{b} = \langle \mathbf{x}_t - \mathbf{x}_a \rangle$
 - Analyzed covariance $\mathbf{A}_{ij} = \langle (\mathbf{x}_{ti} - \mathbf{x}_{ai} - \mathbf{b}_i)(\mathbf{x}_{tj} - \mathbf{x}_{aj} - \mathbf{b}_j) \rangle$
 - Variance reduction $\mathbf{V}_r = \text{diag}(\mathbf{I} - \mathbf{A}\mathbf{B}^{-1})$
 - Degrees of freedom for signal $DFS = \text{Trace}(\mathbf{I} - \mathbf{A}\mathbf{B}^{-1})$



Variance Reduction for temperature profiles



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Reduction slightly less for BT3SIG due to less channels

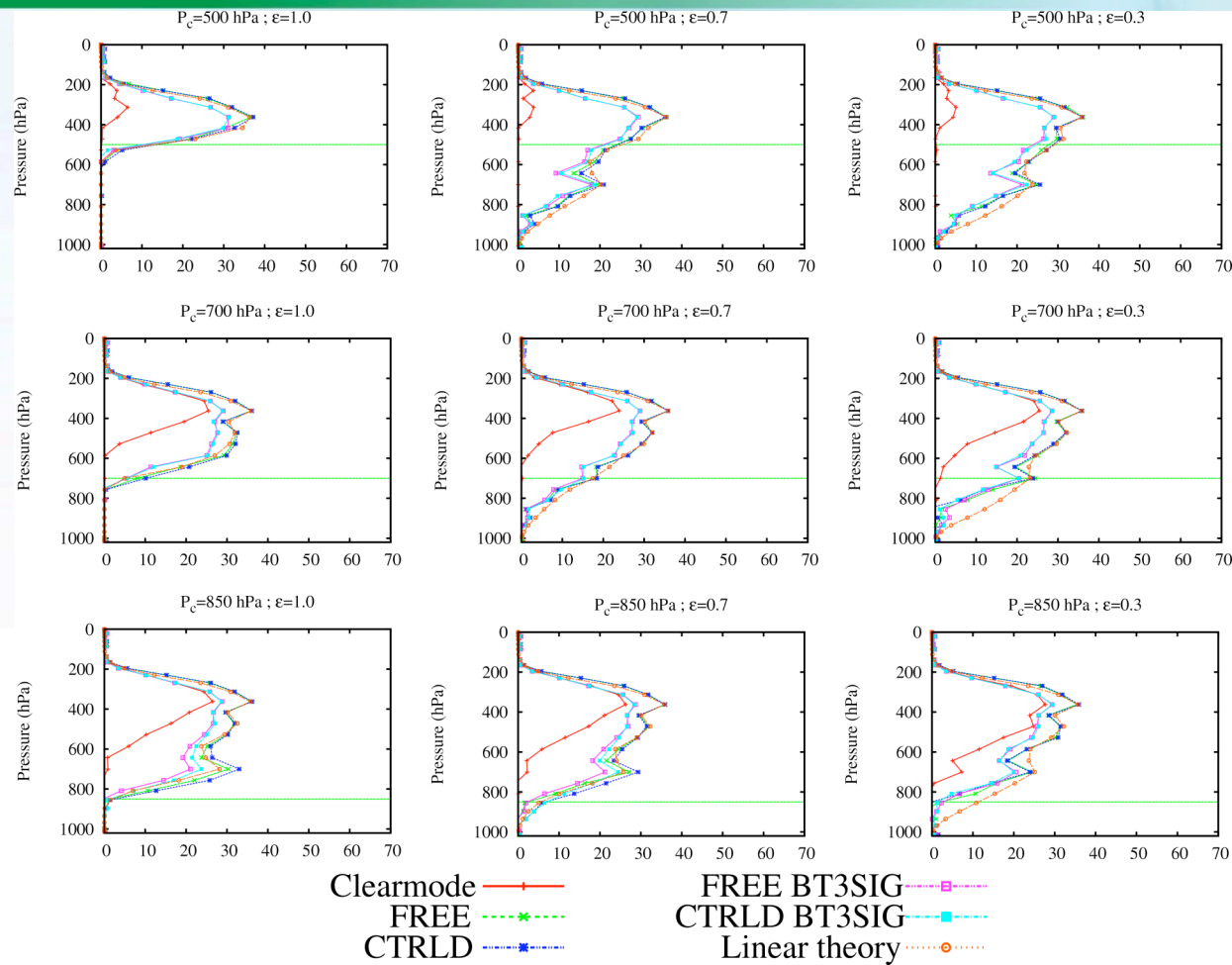


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Variance reduction for water vapor profiles



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Temperature degrees of freedom for signal (DFS) for the CLR, FREE and FREE BT3SIG experiments.

| | $P_c=850$ hPa | $P_c=700$ hPa | $P_c=500$ hPa |
|---|---------------------------------|---------------------------------|---------------------------------|
| $\epsilon(15\mu\text{m})=1.0$ | <i>0.904 / 1.871 / 1.519</i> | <i>0.847 / 1.682 / 1.439</i> | <i>0.232 / 1.162 / 1.106</i> |
| $\epsilon(15\mu\text{m})=0.7$ | <i>0.949 / 1.875 / 1.692</i> | <i>0.762 / 1.693 / 1.493</i> | <i>0.119 / 1.389 / 1.193</i> |
| $\epsilon(15\mu\text{m})=0.3$ | <i>1.151 / 1.810 / 1.705</i> | <i>0.938 / 1.738 / 1.590</i> | <i>0.185 / 1.496 / 1.380</i> |

Temperature profile DFS for clear sky case using all (100) channels: 2.299

Logarithm of water vapour mixing ratio degrees of freedom for signal (DFS) for the CLR, FREE and FREE BT3SIG experiments.

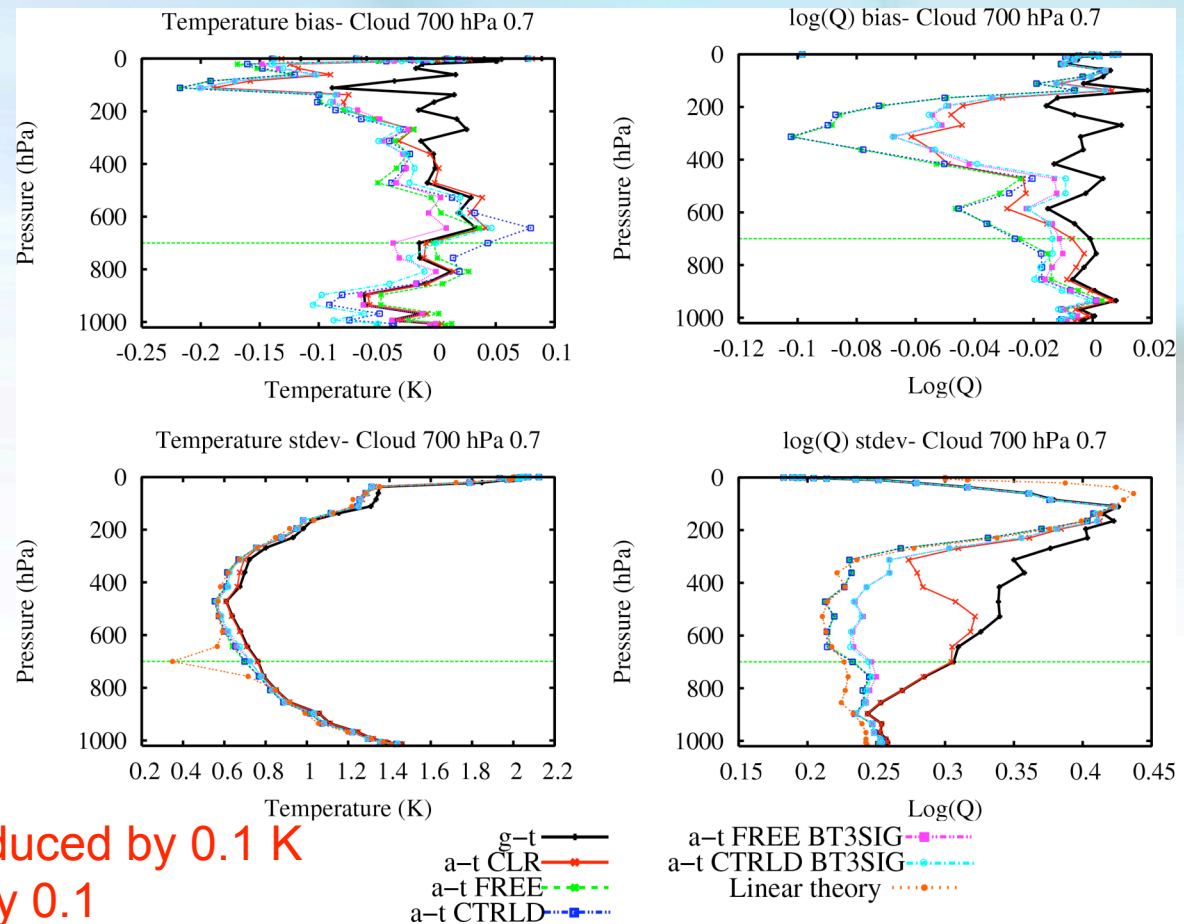
| | $P_c=850$ hPa | $P_c=700$ hPa | $P_c=500$ hPa |
|---|---------------------------------|---------------------------------|---------------------------------|
| $\epsilon(15\mu\text{m})=1.0$ | <i>1.378 / 3.190 / 2.425</i> | <i>1.158 / 2.643 / 2.080</i> | <i>0.209 / 1.733 / 1.414</i> |
| $\epsilon(15\mu\text{m})=0.7$ | <i>1.433 / 3.081 / 2.482</i> | <i>1.060 / 2.882 / 2.349</i> | <i>0.146 / 2.767 / 2.225</i> |
| $\epsilon(15\mu\text{m})=0.3$ | <i>1.778 / 2.986 / 2.475</i> | <i>1.339 / 3.012 / 2.483</i> | <i>0.187 / 3.075 / 2.522</i> |

Log(q) profile DFS for clear sky case using all (100) channels: 3.427

Detailed analysis of the (700 ; 0.7) configuration

Bias

Standard deviation



Std (Temp) reduced by 0.1 K
and std ln(q) by 0.1
Ln(q) biases reduced in BT3SIG

Note: tropical error background stats

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Cloud parameter retrieval statistics

P_c STDDEV (hPa) before/after assimilation

| | $P_c=850$ hPa | $P_c=700$ hPa | $P_c=500$ hPa |
|---------------------------------|---------------------------------|---------------------------------|---------------------------------|
| $e(15mm)=1.0$ | 55.43 / 13.41 | 23.54 / 9.21 | 13.36 / 5.77 |
| $e(15mm)=0.7$ | 63.96 / 31.55 | 50.63 / 18.38 | 30.38 / 10.82 |
| $e(15mm)=0.3$ | 79.94 / 108.85 | 79.46 / 63.45 | 71.23 / 36.07 |

15 μm cloud emissivity STDDEV before/after assimilation

| | $P_c=850$ hPa | $P_c=700$ hPa | $P_c=500$ hPa |
|---------------------------------|---------------------------------|---------------------------------|---------------------------------|
| $e(15mm)=1.0$ | 0.17 / 0.02 | 0.06 / 0.0001 | 0.032 / 0.00009 |
| $e(15mm)=0.7$ | 0.19 / 0.12 | 0.13 / 0.05 | 0.070 / 0.024 |
| $e(15mm)=0.3$ | 0.34 / 0.26 | 0.21 / 0.11 | 0.12 / 0.04 |



Large improvement from assimilation over CO₂ slicing guess
Problems with low clouds with low emissivity
Target is 35 hPa for P_c and 0.035 for emissivity

Sensitivity to size parameter (1)

- Climatological values are used as first guess for \mathbf{r}_e , \mathbf{D}_e . For δ and \mathbf{P}_c a first guess is obtained from CO₂ slicing.
- The size parameter is allow to vary in the assimilation. What is the impact of an error on the initial value ?
- Is there some skill in retrieving the size parameter?



Sensitivity to particle size (2)

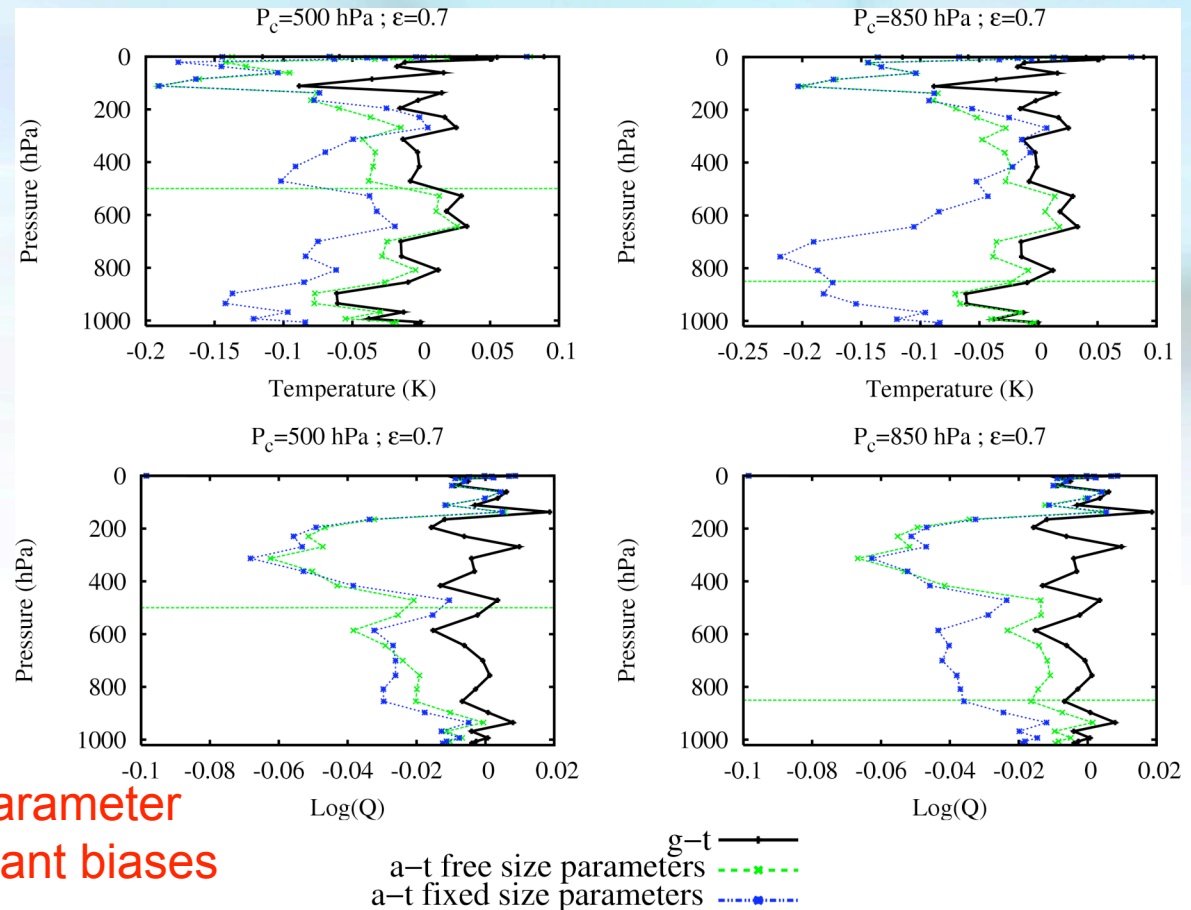
Assumed particle sizes :

- 8 μm for r_e (instead of 13)
- 50 μm for D_e (instead of 25)

Impact on biases

Ice cloud

water cloud



Fixing the size parameter
Results in significant biases

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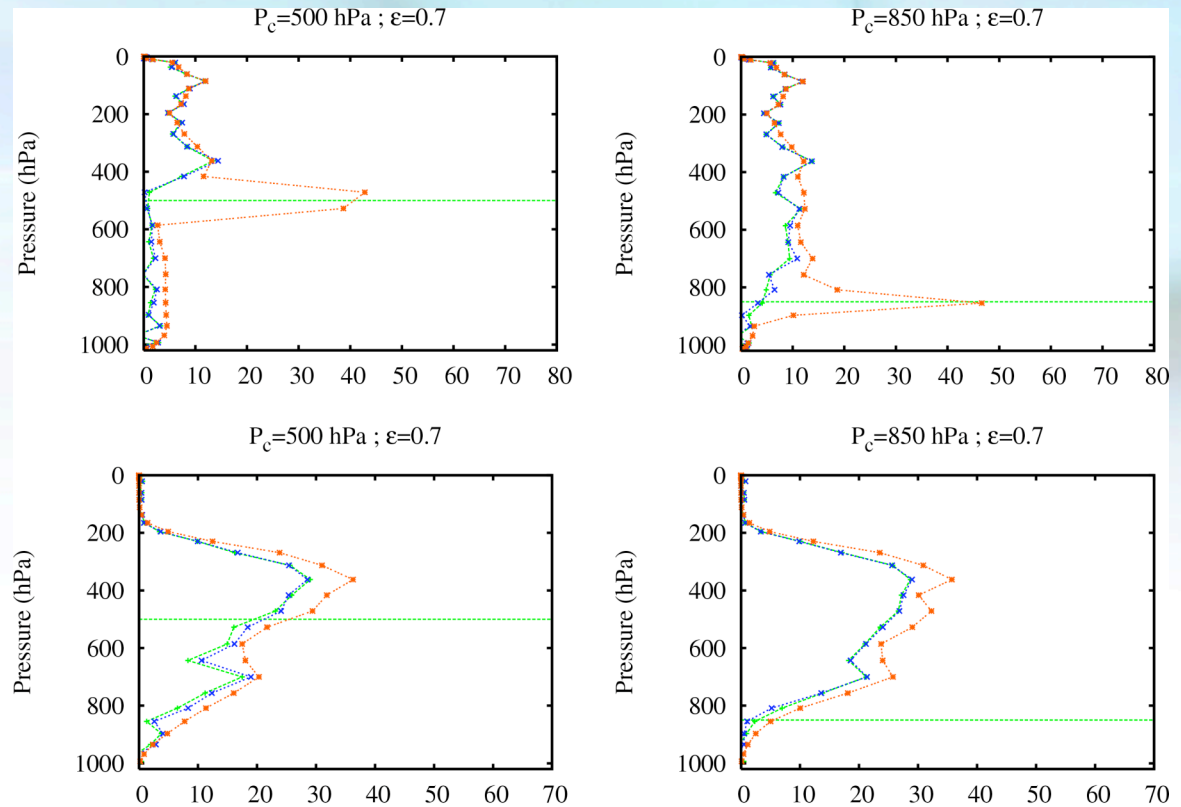
Sensitivity to particle size (3)

Variance reduction (Temp: top; $\ln(q)$: bottom)

Assumed particle sizes :

- 8 μm for r_e (instead of 13)
- 50 μm for D_e (instead of 25)

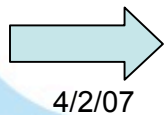
Impact on error variance reduction



Fixing the size parameters has a minor impact on variance reduction

free size parameters ---+---
fixed size parameters ---x---
Linear theory□.....

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Retrieving skill associated with D_e , R_e ?

- From 1000 simulations:
- R_e : guess: 13 μm , true: 8 μm ; $P_c = 850$ Hpa, emi (15 μm = 0.7). The retrieved mean R_e was 9.3 μm (bias of 1.3 μm) and STD = 3.0 μm .
- D_e : guess: 25 μm , true 50 μm ; $P_c = 500$ hPa emi (15 μm = 0.7. The retrieved mean D_e was 37.5 μm (bias of 12.5 μm) and STD = 8.1 μm .



Capability to retrieve effective particle size has some value, with rms errors in the 30-50 % range

Conclusions (1)

- Assimilation of cloudy radiances from AIRS has the potential to significantly improve NWP analyses of temperature and humidity
- Highest impact expected for mid-level scattered clouds situations in the layer just above the cloud. Some skill also noted below cloud level
- Better to let cloud parameters only weakly constrained to avoid biases in sounding retrievals
- Cloud parameters most difficult to infer for low clouds and low emissivity
- Cloudy assimilation expected to be most successful for cases where $\text{std}(\text{Pc}) < 35 \text{ hPa}$ and $\text{std}(\text{emi}) < 0.035$. Pre-determining such cases is a challenge.
- There is some skill in retrieving the cloud effective particle size: errors of the order of 30-50%.
- Using real data will no doubt create additional sources of uncertainty such as bias correction for cloudy radiances and the need to avoid problematic cases such as multi-layered fields-of-view.



Conclusions (2)

- The idea of predefining the cloud parameters in (e.g. via 1D-var) and to keep these fixed in 3D/4D assimilation is likely to lead to biases. It is preferable to use all available data together.
- Therefore, the operational assimilation code has been modified to include the *local* estimate of the 4 cloud parameters in the 4D-var minimization.
- First 3D/4D assimilation results with real data should be available soon.





Thank you!

